## Lidar Sensor – Future Data Collection Process

P.M. – Andrea Hodge Transportation Statistics Office, Florida DOT

P.I. – Carl Crane Dept. of Mech. & Aero. Engr., UF



# **UF** Background

- autonomous vehicle systems
  - model the environment (lidar & vision)
  - determine appropriate vehicle behavior







# **Overall Project Goal**

- Can the Roadway Characteristics Inventory (RCI)
   process be made more efficient and cost effective by
   collecting and interpreting lidar point cloud data?
- 18 month project, \$150K





### Task List

- Task 1 Perform a literature review of other state departments of transportation use of Lidar for data collection.
- Task 2 Compare and contrast existing LiDAR units/systems and decide which unit/system will be the best for FDOT.
- Task 3 Speak with District data collectors and data collection managers to set the benchmark for time, costs, safety, consistency of data collection, and return on investment as it exists today.
- Task 4 Use a LiDAR unit to collect RCI data then compare its time, cost, safety, consistency of data collection, and return on investment to each Distr
- Task 5 Determine the feasibility of FDOT to perform in-house LiDAR collection and RCI feature extraction.
- Task 6 Prepare draft and final report.
- Task 7 Final report.



### Task 1 – Literature Review

- identified 31 papers and reports that are related to sensor based data collection
  - several lidar cases had data taken from the air
  - some papers concluded that lidar data provided a higher than necessary level of detail and that other less costly alternatives existed (vision)
  - several papers described combining lidar and vision
  - FDOT District 4 paper published in 2013 was very relevant
    - vision and lidar data collected in the field and analyzed manually in the office
    - collection process was simplified and collection times were improved
    - analysis time took too long and made the effort not economical



### Task 1 – Literature Review, Conclusions

- Lidar sensors generate an abundance of data. A typical sensor can collect approximately 50 MB of data in 1 minute. Structuring this data so that it can be processed and managed efficiently is a challenging problem.
- The accuracy of range data varies between sensor models. A point cloud generated by a sensorwhose range values are within ±1 cm will be much easier to analyze than a point cloud generated by a sensor with a range accuracy of ± 3 cm.
- The position and orientation accuracy for a mobile sensor is very important.
   GPS and inertial sensors must accurately report the correct sensor position so that data points can be accurately merged.
- Characterization of objects in the point cloud is a difficult problem. Most researchers have used random seed points to begin point grouping.



### Task 1 – Literature Review, Conclusions

- Cost, both personnel and hardware, is not discussed in most of the references with the exception of the District 4 report.
- Upon reviewing the literature, a system combining vision and lidar may be best able to classify highway features. A combination of color information from the vision sensor and range and reflectance data from the lidar may result in a more robust feature classification algorithm.



## Task 3 – District Meetings

### Visits

- District 6 Ft. Lauderdale, 13 July
- District 4 Miami, 14 July
- District 3 Chipley, 18 July

### Discussion

- measurement accuracy
- feature extraction is key
- important features
  - sidewalks, medians, intersections, shoulders, curbing, thru lanes, turn lanes
- test sections of highway identified



| Administrative Features (22) |                               | Operati | Operational Features (13)    |  |
|------------------------------|-------------------------------|---------|------------------------------|--|
| 111                          | State Road System             | 311     | Speed Limits                 |  |
| 112                          | Federal System                | 312     | Turning Restrictions         |  |
| 113                          | AASHTO                        | 313     | Parking                      |  |
| 114                          | Local System                  | 320     | Mile Marker Signs            |  |
| 118                          | HPMS                          | 322     | Signals                      |  |
| 119                          | HPMS Universe                 | 323     | School Zones                 |  |
| 120                          | Typeroad                      | 326     | Traffic Monitoring Sites     |  |
| 121                          | Functional Classification     | 330     | Traffic Flow Break Station   |  |
| 122                          | Facility Classification       | 331     | Traffic Flow Breaks          |  |
| 124                          | Urban Classification          | 341     | Lighting System              |  |
| 125                          | Adjacent Land Classification  | 351     | Motorist Aid System          |  |
| 137                          | Maintenance Area Boundary     | 360     | Toll Plazas                  |  |
| 138                          | Roadway Realignment           | 361     | Service Plazas               |  |
| 139                          | New Alignment                 |         |                              |  |
| 140                          | Section Status Exception      | Physica | l Features (26)              |  |
| 141                          | Stationing Exceptions         | 212     | Thru Lanes                   |  |
| 142                          | Managed Lanes                 | 213     | Auxiliary Lanes              |  |
| 143                          | Associated Station Exception  | 214     | Outside Shoulders            |  |
| 144                          | Fla. Intrastate Hwy System    | 215     | Median                       |  |
| 145                          | Level of Service Input Data   | 216     | Bike Lanes/Ped Sidewalk      |  |
| 146                          | Access Management             | 217     | Sidewalks                    |  |
| 147                          | Strategic Intermodal System   | 219     | Inside Shoulders             |  |
|                              |                               | 220     | Non Curve Intersection Point |  |
| Mainter                      | nance Features (17)           | 221     | Horizontal Curve             |  |
| 411                          | Roadside Mowing               | 230     | Surface Description          |  |
| 412                          | Weed Control                  | 232     | Surface Layers               |  |
| 413                          | Landscape Area                | 233     | Base                         |  |
| 421                          | Roadside Ditch Cleaning       | 241     | Crossdrains                  |  |
| 422                          | Median Ditch Cleaning         | 242     | Storm Sewers                 |  |
| 431                          | Parks and Rest Areas          | 243     | Off Roadway Areas            |  |
| 443                          | Delineators                   | 245     | Roadside Ditches             |  |
| 451                          | Striping                      | 248     | Outfall Ditches              |  |
| 452                          | Symbols and Messages          | 251     | Intersection                 |  |
| 453                          | Cross Walks                   | 252     | Interchanges                 |  |
| 454                          | Stop Bars                     | 253     | Railroads                    |  |
| 455                          | Raised Pavement Markers       | 256     | Turnouts                     |  |
| 456                          | Retroreflectivity Measurement | 257     | Crossovers                   |  |
| 457                          | Retroreflectivity Parameters  | 258     | Structures                   |  |
| 460                          | Attenuators                   | 271     | Guardrail                    |  |
| 480                          | Highway Signs                 | 272     | Fencing                      |  |
| 481                          | Highway Maint. Classification | 275     | Misc. Concrete Structures    |  |
|                              |                               |         |                              |  |

**Rail Line (1)** 901 Rail Line Facility

### Scope:

| Administrative Features (22) |                               |  |  |  |
|------------------------------|-------------------------------|--|--|--|
| 111                          | State Road System             |  |  |  |
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|---------|----------------------------|
| 11      | Speed Limits               |
| 12      | Turning Restrictions       |
| 13      | Parking                    |
| 20      | Mile Marker Signs          |
| 22      | Signals                    |
| 23      | School Zones               |
| 26      | Traffic Monitoring Sites   |
| 30      | Traffic Flow Break Station |
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Physical Features (26)

| Filysical Features (20) |                              |  |  |  |
|-------------------------|------------------------------|--|--|--|
| 212                     | Thru Lanes                   |  |  |  |
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#### Rail Line (1) 901

Rail Line Facility

# Task 2 – Survey of Lidar Units

 Is there a suitable lidar unit in the price range of \$8-9K that can acquire sufficient data for RCI?



# Equipment

inclination and magnetic sensors

Velodyne 'puck' lidar





### **VLP-16**

#### Sensor:

- Time of flight distance measurement with calibrated reflectivities
- 16 channels
- Measurement range up to 100 meters
- Accuracy: +/- 3 cm (typical)
- Dual returns
- Field of view (vertical): 30° (+15° to -15°)
- Angular resolution (vertical): 2°
- Field of view (horizontal/azimuth): 360°
- $\bullet$  Angular resolution (horizontal/azimuth): 0.1° 0.4°
- Rotation rate: 5 20 Hz
- Integrated web server for easy monitoring and configuration



### Schedule

- 14 May: pre-survey of site 1
- 17 May: post-survey of site 1; pre-survey of site 2
- 25 May: post-survey of site 2

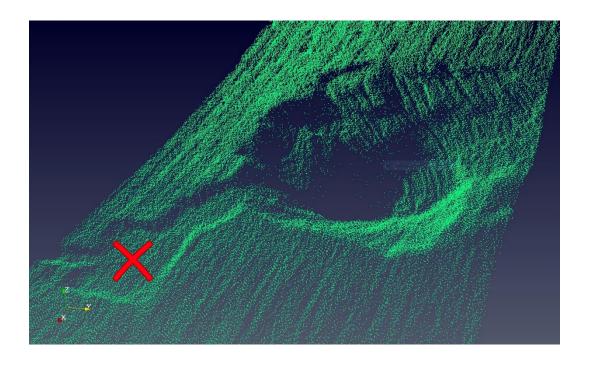




# Post-survey of site 1

Scans performed from three vantage









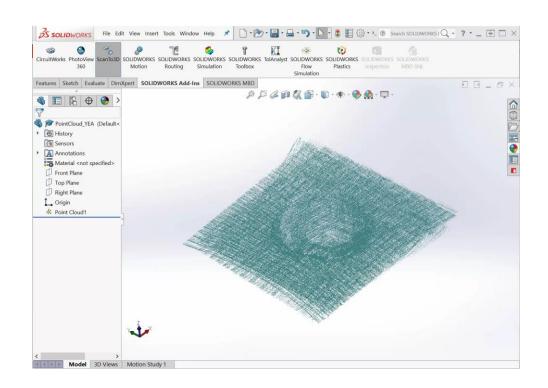


# Site 1: Three data sets merged (cloud compare)



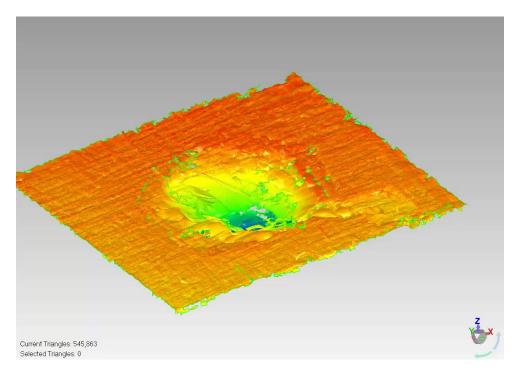


# Site 1: Merged point cloud imported to SolidWorks





# Attempt to mesh (geomagic trial software)



problem with filling all holes to obtain a 'water tight' surface



# Task 2 – Survey of Lidar Units

- cost constraint is \$8.5K
- will run preliminary tests on two units before making recommendation to purchase



Velodyne VLP-16



Sick LMS-100

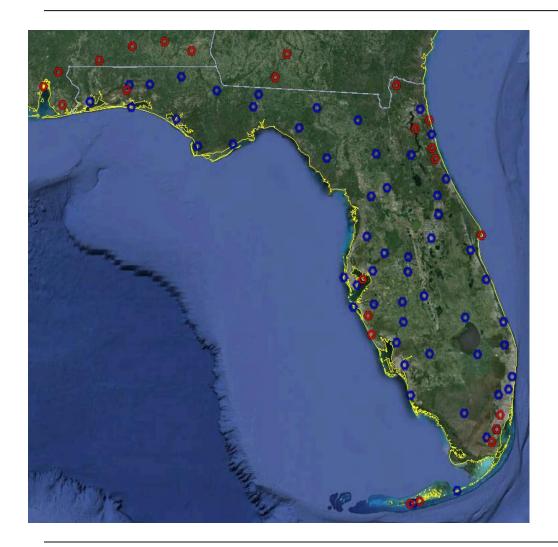


## Task 4 – Data Collection & Interpretation

- acquire lidar unit
- design data acquisition apparatus
  - require accurate position and orientation data
- data storage and interpretation

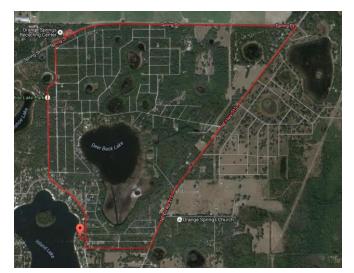


### Florida Permanent Reference Network (FPRN)



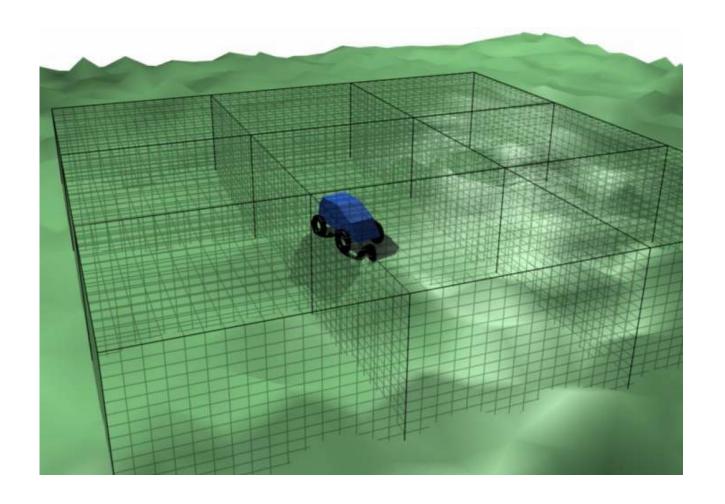
RTK data corrections augment GPS to give cm level accuracy.

Low cost GPS (~\$200) combined with this system will replace \$8K GPS with \$1.5K annual subscription.





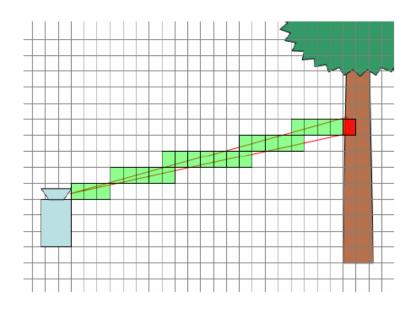
# Voxel Based Data Representation

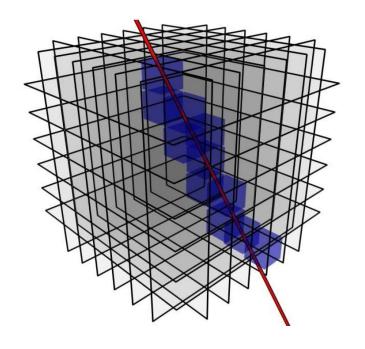




# Voxel Occupancy

- A 3-D version of Bresenham's line function is used to determine all the cells through which a line segment passes.
- Occupancy of free space voxels are decremented.
- Occupancy of object voxels are incremented.

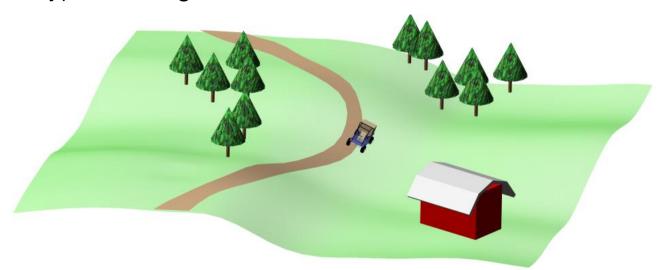






## Implementation – Identify Ground Surface

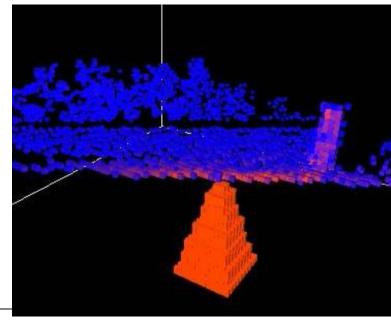
- Identifying the voxels that make up the ground surface is critical.
- It can be assumed that there will be no occupied voxels below a ground surface voxel.
- Also, since no beams can penetrate below the ground surface, there should be no voxels with a free space value (known zero occupancy) below a ground surface voxel.





### Identify Ground Surface

- Candidate ground surface voxels are evaluated one at a time.
- A pyramidal region of a certain depth and slope is defined below the candidate voxel.
- While searching through the pyramid, if
  - an occupied voxel or known free space voxel is found within it, the voxel fails the ground surface test
  - otherwise, the candidate voxel is marked as being part of the ground surface.

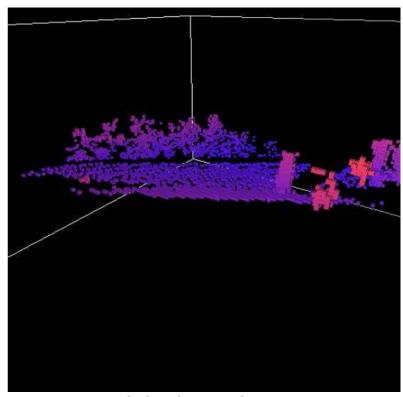




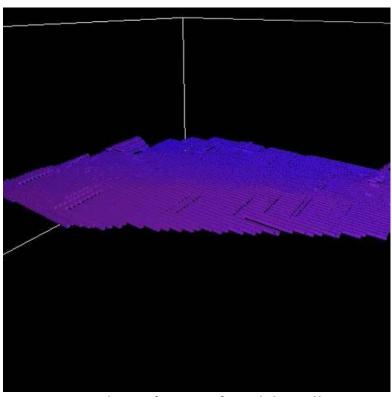
Center for Intelligent Machines and Robotics
College of Engineering

## **Implementation**

Identify Ground Surface



original voxel scene

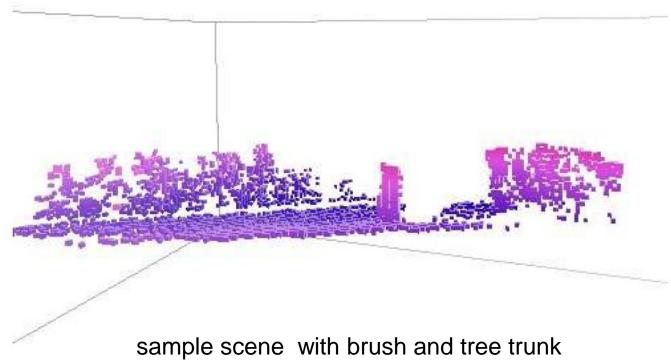


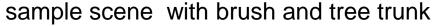
ground surface after blending



# **Implementation**

Estimate object heights; Identify Tree Trunks

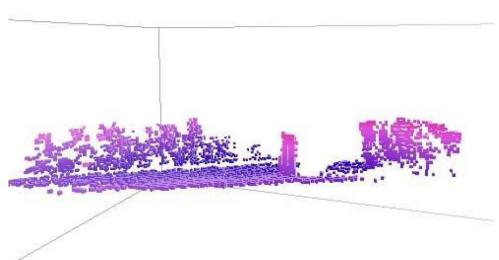






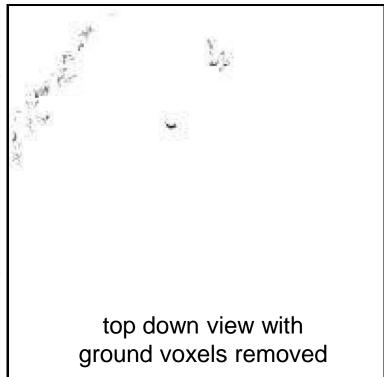
# **Implementation**

Estimate object heights; Identify Tree Trunks



create above ground density plot

- 2D array
- each array position stores the number of voxels occupied above ground





Sample Data Set – Dynamic Case



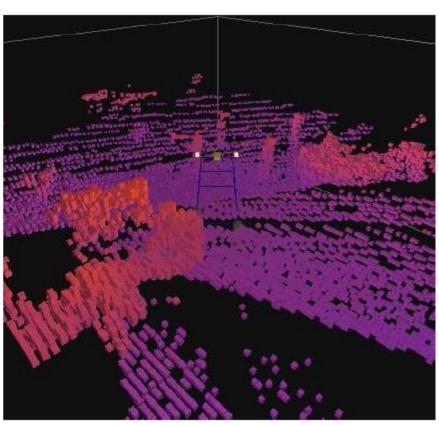
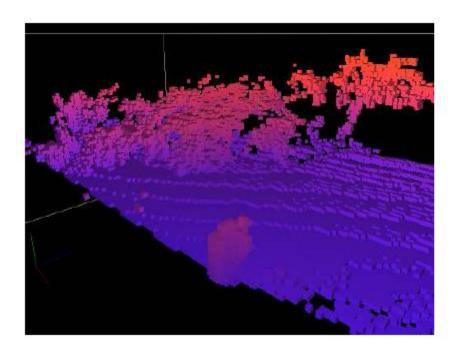
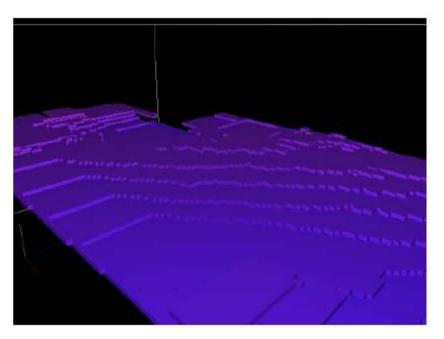


image & snapshot of the voxel data taken at the same time



Sample Data Set – Dynamic Case

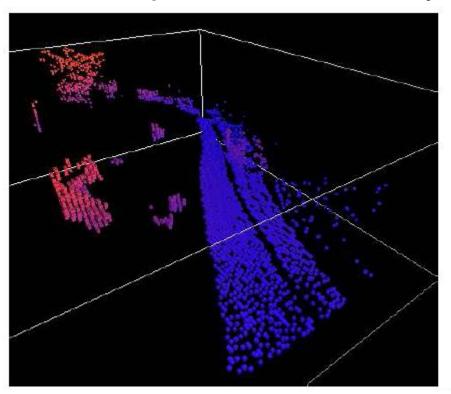


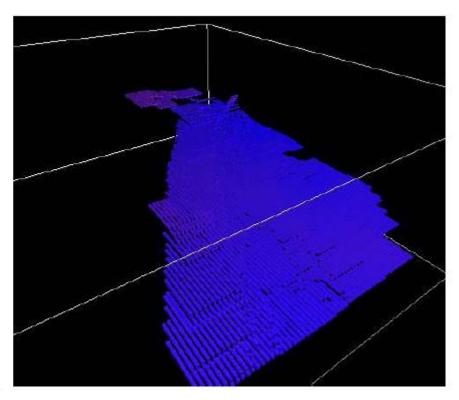


Results of ground surface identification among heavy brush.



Sample Data Set – Dynamic Case

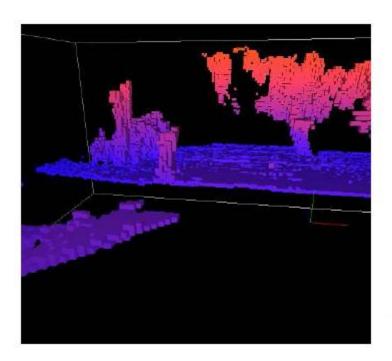




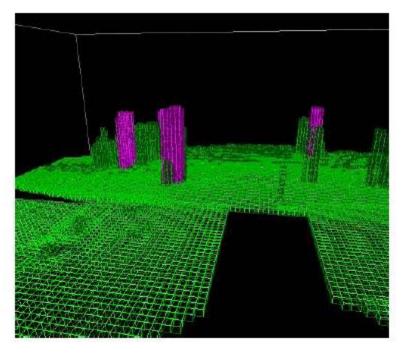
Results of ground surface identification with sparse data.



### Sample Data Set – Dynamic Case



original data colored by height



Green voxels represent the ground surface, dark green the brush, and purple the tree trunks.



# Summary

- Task 1 Literature Review, complete
- Task 3 Site Visits
  - visits conducted
  - test highways identified
  - report to be written
- Task 2 Survey Lidar Units
  - candidates identified
  - one unit tested in the field
  - need to test two models before deciding on sensor
- Task 4 Data Collection & Identification
  - approach developed

